# Interaction between FOXO1A-209 Genotype and Tea Drinking

## is Significantly Associated with Reduced Mortality at Advanced Ages

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#### Abstract

Based on the genotypic/phenotypic data from Chinese Longitudinal Healthy Longevity Survey (CLHLS) and Cox proportional hazard model, the present study demonstrates that interactions between carrying FOXO1A-209 genotypes and tea drinking are significantly associated with lower risk of mortality at advanced ages. Such significant association is replicated in two independent Han Chinese CLHLS cohorts (p =0.028-0.048 in the discovery and replication cohorts, and p = 0.003 - 0.016 in the combined dataset). We found the associations between tea drinking and reduced mortality are much stronger among carriers of the FOXO1A-209 genotype compared to non-carriers, and drinking tea is associated with a reversal of the negative effects of carrying FOXO1A-209 minor alleles, that is, from a substantially increased mortality risk to substantially reduced mortality risk at advanced ages. The impacts are considerably stronger among those who carry 2 copies of the FOXO1A minor allele than those who carry 1 copy. Based on previously reported experiments on human cell models concerning FOXO1A-by-tea-compounds interactions, we speculate that results in the present study indicate that tea drinking may inhibit FOXO1A-209 gene expression and its biological functions, which reduces the negative impacts of FOXO1A-209 gene on longevity (as reported in the literature) and offers protection against mortality risk at oldest-old ages. Our empirical findings imply that the health outcomes of particular nutritional interventions, including tea drinking, may, in part, depend upon individual genetic profiles, and the research on the effects of nutrigenomics interactions could potentially be useful for rejuvenation therapies in the clinic or associated healthy aging intervention programs.

## **Key Words:**

Aging, Gene Targeting, Diet, Mortality, Longevity

Abbreviated title: FOXO1A-by-Tea-Drinking Interaction and Mortality

#### INTRODUCTION

Various studies have shown that, in addition to direct effects of environmental and genetic factors on health and mortality, interactions between genotypes and environmental factors (GxE) play a crucial role in health outcomes because environmental factors may modulate gene expression, which then influences health and longevity.<sup>[1-2]</sup> The Institute of Medicine (IOM) Committee recommends in their widely-cited report: "…to expand our knowledge of how to improve the health of individuals and populations, it becomes imperative to conduct research that explores the effects of interactions among social, behavioral and genetic factors on health".<sup>[1]</sup>

Prior research has shown that two SNPs of the FOXO1A gene, located on chromosome 13, were associated with longevity in the Han Chinese population.<sup>[3]</sup> FOXO1A genetic variants have also been linked to longevity in the Framingham cohort in the U.S.<sup>[4]</sup> and in the Leiden 85-plus study.<sup>[5]</sup>

Dietary habits are important behavioral/environmental factors in people's daily life. Especially among Chinese people, whether (and how often) to drink tea may be a critical dietary factor. Accumulating data from various studies indicates tea drinking improves health and reduces the risk of mortality and age-associated chronic diseases, such as inflammation <sup>[7]</sup> and stroke.<sup>[8]</sup> Tea drinking also reduces depressive symptoms in old adults in rural China,<sup>[8]</sup> and is associated with better cognitive function in Chinese elderly in Singapore,<sup>[9]</sup> and in the oldest-old in China.<sup>[10]</sup>

Specific to mortality, evidence from animal model studies suggests that compounds in tea can increase lifespan.<sup>[11]</sup> Longitudinal or cohort studies from Japan reported that tea consumption was associated with reduced risk of mortality from cardiovascular diseases,<sup>[12]</sup>

and cancer.<sup>[13]</sup> A recent study based on the Chinese Longitudinal Healthy Longevity Survey (CLHLS) data also showed that tea drinking was significantly associated with reduced mortality among the oldest-old aged 80+.<sup>[14]</sup> Other research based on CLHLS data discovered that the GxE interaction between FOXO1A-rs2755209 (abbreviated as FOXO1A-209 hereafter) genotype and regular exercise was significantly associated with reduced mortality risk at advanced ages 92 and over by 31-32 percent (P<0.05), adjusted for various covariates.<sup>[15]</sup>.

Previous GxE studies have shown that the effects of tea consumption on diseases vary by genotypes.<sup>[16,17]</sup> Based on human cell experiments, Anton et al. showed that the tea polyphenol Epigallocatechin gallate (EGCG) mimics insulin action on the transcription factor FOXO1A and elicits cellular responses in the presence and absence of insulin; thus, the intake of tea compounds inhibits FOXO1A gene expression and its biological functions<sup>[18]</sup>. Belguise et al. reported that intake of green tea EGCG activated FOXO3A gene expression, which in turn induced estrogen receptor- $\alpha$  (ER- $\alpha$ ) expression and reversed invasive phenotype of breast cancer cells in mice.<sup>[19]</sup> It was reported that tea consumption is associated with longer telomere length in elderly Chinese men <sup>[20]</sup>. A recent study demonstrated that GxE interactions between carrying one of the single-nucleotide polymorphisms (SNPs) of FOXO1A-rs17630266, FOXO3A-rs2253310 or FOXO3A-rs2802292 and tea drinking were significantly associated with lower risk of cognitive disability at advanced ages.<sup>[21]</sup> However, we are not aware of any studies of the effects of GxE interactions between the FOXO1A genotype and tea drinking on mortality in human populations.

Given the important roles of tea compounds in studies of the health outcomes of humans, the association of the FOXO1A SNP with longevity, the FOXO1A-by-tea interaction effects in human cell experiments, and the effects of FOXO1A-209-by-regular exercise interaction on mortality at advanced ages in China as reviewed above, we posed a hypothesis to be tested in the present study: that is, GxE interactions between carrying the SNP of FOXO1A-209 gene and tea drinking could be significantly associated with reduced mortality risk in Chinese oldest-old.

Previous studies have indicated that, in general, genetic and GxE impacts on health and mortality are more profound at advanced ages.<sup>[22,23]</sup> Moreover, the oldest-old population, which is more likely to need care assistance, has been increasing much more rapidly than younger age groups in a multitude of countries. For example, based on United Nations population projections, the average annual growth rates from 2010 to 2050 for the oldest-old aged 90 or over are 3.6% and 4.0%, in contrast to 1.8% and 2.7% for the elderly aged 65-89 in the United States and China, respectively <sup>[24]</sup>. These data imply that focusing on the oldest-old is a useful way to investigate GxE effects on healthy aging and longevity for public health programs. However, almost all previous studies in this field have focused on young-old or middle-aged adults; few studies have had large enough numbers of oldest-old subjects to gain the necessary statistical power to carry out meaningful analyses. The objective of the present study is to make a significant contribution to the field based on an unusually large sample of oldest-old with both genetic and environmental data.

#### 2. DATA SOURCES, MEASUREMENTS AND METHODS

#### Data sources

The Chinese Longitudinal Healthy Longevity Survey (CLHLS) which provided data for the present study has been collecting a comprehensive data set from the oldest-old and compatible younger elders since 1998. The CLHLS surveys have been conducted in a randomly selected half of the counties and cities in 23 out of 31 provinces in China, with replacement for deceased elders, namely, new participants were recruited to replace those who died after last interview in each of the waves from 1998 to 2008-2009. The 23 provinces where CLHLS has been conducted cover about 85% of the total population of China. Extensive data were collected in CLHLS using internationally standardized questionnaires adapted to the Chinese cultural and social context. Careful evaluations, including reliability coefficients, factor analysis, age reporting at the oldest-old ages, genetic and GxE analyses, have shown that the data (including mortality and genotypic data) quality of CLHLS surveys is reasonably good. <sup>[3, 15, 21, 25-28]</sup>

Our analyses are based on genotypic and phenotypic data from two independent CLHLS cohorts to facilitate discovery and replication. (1) Cohort 1998 consists of 810 oldestold, aged 91+, interviewed in the 1998 initial baseline survey of the CLHLS and its subsequent follow-up surveys conducted in 2000, 2002, 2005, 2008-2009, 2011-2012. Dates of death were collected for the 99.7 percent of individuals who died before the CLHLS 2011-2012 wave. (2) Cohort 2008-2009 consists of 1,671 oldest-old aged 91+ interviewed in the CLHLS 2008-2009 wave and its subsequent follow-up surveys conducted in 2011-2012. Dates of death were collected for the 55.7 percent of individuals who died before the CLHLS 2011-2012 wave. There is no overlap between the CLHLS participants in Cohort 1998 and Cohort 2008-2009, and there are no familial/kinship relations among the participants within and across the cohorts. Thus, these two cohorts are totally independent study samples for discovery (Cohort 1998) and replication (Cohort 2008-2009). All of the participants from these two cohorts belong to the same ethnic group of Han Chinese living in one country within the same culture; thus, we also performed a combined analysis including all members of Cohort 1998 and Cohort 2008-2009.

The FOXO1A-209 genotypic data from Cohort 1998 were produced by genotyping the DNA samples from the CLHLS participants at the lab of Institute of Molecular Medicine at Peking University; analyses of the genotypic data, including quality control procedures, single SNP association analysis, genotype association analysis, linkage disequilibrium and haplotype association analysis , were presented in Li et al. <sup>[3]</sup>, and are not repeated here.

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The FOXO1A-209 genotypic data of Cohort 2008-2009 were drawn from the CLHLS genomewide association study (GWAS) dataset which was most recently produced by the Beijing Genomics Institute (BGI), and the BGI genotyping quality control procedures of the CLHLS GWAS (including computing identity-by-state probabilities for all subjects to search for and to exclude any kinship-related individuals among the samples) are presented in section M2 of Methods of the reference <sup>[29]</sup>.

#### **Dependent variable**

Mortality information on date of death was collected in the CLHLS follow-up surveys from interviews with a close family member for participants who were interviewed in the CLHLS wave(s) but died afterwards. Survival time of the subjects analyzed in this study was entered as days counted from the date of the initial interview in 1998 or 2008-2009 to the date of death or censoring at the time of the 2010-2011 interview for those who were still alive. We controlled for respondent's exact age in the1998 or 2008-2009 survey.

## Main explanatory variables: FOX01A genotype and tea drinking

FOXO1A genotype. We explore GxE interactions between tea drinking and the FOXO1A genotype (carrying the SNP of FOXO1A-209) following the additive, recessive, and dominant models. In the additive model, a genotype that contains 0, 1 or 2 copies of the minor allele is coded as 0, 1 or 2. In the recessive model, a genotype that contains 2 copies of the minor allele is coded as 1; otherwise a genotype that does not contain or contains only one copy of the minor allele is coded as 0. In a dominant model, any genotype that contains 1 or 2 copies of the minor allele is coded as 1; otherwise, a genotype that does not contain any copy of the minor allele is coded as 0.

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*Tea Drinking*. CLHLS respondents were asked: Do you drink tea regularly? Response categories were "almost every day"; "sometimes"; and "rarely or never". We defined "tea drinking" as a binary variable and as an ordered variable. The binary tea drinking variable is coded as 1 if the answer is "almost every day" or "sometimes", and coded as 0 otherwise. The ordered tea drinking variable is coded as 0 for "rarely or never", 1 for "sometimes" or 2 for "almost every day".

#### **Other covariates**

Other covariates controlled in our multiple statistical models include gender, exact age at time of the DNA sample collection, residence (rural vs. urban), education (<1 year of schooling vs. ≥1 year of schooling; note that education level among those oldest-old Chinese cohorts was extremely low, only 18.1% of the participants had 1+ years of schooling; see Table 1), marital status (currently married vs. unmarried including never-married, divorced or widowed), regular exercise (yes vs. no), smoking (yes vs. no), and alcohol drinking (yes vs. no). We also adjusted for the groups of 1998 cohort and 2008-2009 cohort in the combine analysis.

The statistical frequency distributions of the main explanatory variables and covariates are presented in Table 1.

---Table 1 about here--

## Statistical analysis

To examine associations of explanatory variables with mortality risk, we employed multiple proportional hazards regression model analysis with survival time and mortality as the dependent variable. The assumption of proportionality of the hazards was assessed and met the requirement for all of the models analyzed. To examine interaction effects, we followed the standard Aiken and West procedure to examine whether the interaction terms included in the regressions are statistically significant and whether model fit is significantly better when the interaction term is included.<sup>[30]</sup> The results of these additional likelihood ratio and chi square tests are listed in the last three rows of Table 2 and are consistent with the p value estimates of the interaction terms. The significant results of these additional tests also imply that the likelihood of a type I error in our estimates of the interaction terms is small.<sup>[31]</sup> The analyses were performed using Stata/SE 12.0.

## 3. RESULTS

We found that the GxE interaction term between carrying the FOXO1A-209 minor allele (recessive model) and tea drinking is significantly associated with lower risk of mortality at advanced ages. In Cohort 1998, the hazard ratio was 0.456 (p=0.037) when tea drinking was measured as a binary variable and 0.662 (p=0.048) when measured as an ordered variable (Table 2). This significant association was replicated in Cohort 2008-2009 (p = 0.028 or p = 0.042 in the binary or ordered models, respectively). The FOXO1A-209-by-tea-drinking interaction terms were associated with substantially reduced mortality risk (hazard ratio = 0.465 to 0.666) and highly significant in the integrated analysis of both cohorts combined (p = 0.003 or p = 0.006). With the additive model, the GxE interaction term between carrying the FOXO1A-209 minor allele and drinking tea (ordered variable) is significantly associated with lower mortality risk at advanced ages in Cohort 2008-2009 (p = 0.018), while the association is not significant in Cohort 1998, although the direction of reducing mortality risk is consistent between the two cohorts; however, the GxE interaction is significant in the combined analysis (p = 0.016) (Table 2). Following the dominant genetic model, the FOXO1A-209-by-tea-drinking GxE interaction is generally associated with reduced mortality risk (hazard ratios were between 0.742 to 0.952), that was directionally similar to those following the additive and recessive genetic

models presented in Table 2, but the estimates following the dominant model were mostly not statistically significant, and they are not presented in Table 2 due to space limitations.

--Table 2 about here-----

Note that the significant estimates of the GxE interaction terms (as shown in Table 2) represent synergistic associations, but may not exactly reflect the true effects of GxE interactions on mortality risk because the estimates may be confounded by correlations between the genotype and environmental factor (abbreviated as rGE).<sup>[32,33]</sup> Therefore, we use the two-sample t-test or the Pearson's chi-squared tests to explore whether the rGE exists. More specifically, we tested whether there were significant differences in the percentage of respondents carrying the FOXO1A-209 genotype (recessive model) or number of copies of the minor allele (additive model), between the tea drinkers and non-drinkers (binary variable) or among those who never, sometimes or often drink tea (ordered variable). If rGE is not statistically significant, the estimates of the interaction terms represent the true GxE interaction effects. Otherwise, we need to conduct path analysis employing structural equation models, adjusted for various confounders, to further explore the direct, indirect, and interactive associations of the genotype and the environmental factor with the health outcome indicator.<sup>[25]</sup>

The results of the statistical tests on the potential rGE were not significant (data not shown due to space limitations), ruling out the rGE correlation as the explanation for the interaction between carrying the FOXO1A-209 minor allele and tea drinking. Thus, the estimates of the GxE interaction terms between carrying the FOXO1A-209 minor alleles and tea drinking presented in Table 2 represent the true associations between the GxE interactions and mortality risk at advanced ages and they are not confounded by a rGE correlation.

An interaction between an environmental factor and a genotype is present if the association between the environmental factor and a health outcome indicator differs among individuals with different status of carrying the genotype, or if the association between the genotype and a health outcome indicator differs among individuals with different exposure to the environmental factor.<sup>[1]</sup> Consequently, in addition to looking at the hazard ratios of the GxE interaction terms presented in Table 2, another more intuitive way to understand the effects of the FOXO1A-by-tea-drinking interactions is to assess differences in the hazard ratio of mortality risk between those who have different combination of the statuses of tea drinking and carrying the FOXO1A-209 genotype (see the Online Supplement Materials for technical notes).

The estimates presented in Table 3 show that, among the non-carriers of FOXO1A-209 minor alleles (recessive model), drinking tea (binary variable) did not affect the mortality risk; but the mortality risk reduction effects of tea drinking among the FOXO1A-209 carriers were -53.3%. The effects of sometimes or often drinking tea (compared to not-drinking tea) on reduced mortality risk were small and not significant among non-carriers of FOXO1A-209 minor alleles. In contrast, among the carriers of FOXO1A-209 genotype, the hazards ratios of mortality risk of the oldest-old who often or sometimes drink tea were about half of those who rarely or never drink tea. The estimates presented in Table 4 indicate that, among those who do not carry any copy of the FOXO1A-209 minor allele or carry 1 copy of the FOXO1A-209 minor allele, the effects of often or sometimes drinking tea were small and not significant; but sometimes or often drinking tea was associated with a reduced mortality risk of about half among those who carry two copies of FOXO1A-209 minor alleles.

----Tables 3 and 4 are here-----

One may also intuitively understand the effects of FOXO1A-209-by-tea-drinking GxE interactions by assessing the genetic effects on mortality risk among tea drinkers compared to non-drinkers. For example, as shown in Table 3 and Figure 1, both following the recessive model, if one rarely or never drinks tea, carrying the FOXO1A-209 genotype (E=0 & G=1) is associated with increased mortality risk of 25.9% (Table 3) and the lowest survival curve (Figure 1), which is consistent with the general results of negative association between FOXO1A-209 genotype and

longevity revealed in previously published cases/controls association analyses<sup>[3, 15]</sup>. In contrast, however, if one often or sometimes drinks tea, carrying the FOXO1A-209 genotype (E=1 & G=1) is associated with decreased mortality risk of 40.4%-41.7% (Table 3) and have the highest survival curve (Figure 1). Estimates presented in Table 4 following the additive model also tell the same story as that found in Table 3. The survival curves in Figure 2 show that, those who carry 2 copies of FOXO1A-209 minor alleles and never or rarely drink tea (G=2 & E=0) had the lowest survival curve (i.e. the highest death rates); in contrast, those who carry 2 copies of FOXO1A-209 minor alleles drink tea (G=2 & E=1) had the highest survival curve (i.e. the lowest death rates), while those who carry 1 copy of FOXO1A-209 minor allele and often or sometimes drink tea (G=1 & E=1) had a modest survival curve in between the highest and the lowest (i.e. the modest death rates).

--Figures 1 and 2 about here---

#### DISCUSSION

The foregoing analyses have shown that GxE interactions between carrying the FOXO1A-209 genotype and drinking tea were significantly associated with lower risk of mortality at advanced ages in the Chinese Han population, after ruling out potential confounding effects of correlations between carrying the FOXO1A-209 minor alleles and tea drinking. Importantly, the significant association between the FOXO1A-209-by-tea-drinking GxE interaction and reduced mortality risk at advanced ages is replicated in the two independent CLHLS cohorts (Table 2). Our estimates clearly showed that the associations between tea drinking (either binary or ordered variable) and reduced mortality at advanced ages were much stronger among carriers of the genotypes of FOXO1A-209 compared to non-carriers, following either additive or recessive models (Tables 3-4 and Figures 1-2), and drinking tea is associated with a reversal of the

negative effects of carrying the FOXO1A-209 minor alleles, from a substantially increased mortality risk to substantially reduced mortality risk at advanced ages. The results indicate that the impacts of reversing the negative effects of FOXO1A-209 genotype on survival at advanced ages is considerably stronger among those who carry 2 copies of the FOXO1A minor alleles than those who carry 1 copy of the minor allele (Figure 2).

We note that our statistical association study (without functional validation tests) did not establish any causal effect of the FOXO1A-by-tea-drinking interactions on healthy aging and longevity, although we speculated that tea consumption may inhibit FOXO1A-209 gene expression and biological functions based on the human cell models reported in the literature <sup>[18]</sup>; thus it reduces the negative impacts of FOXO1A-209 gene on longevity (as reported in the literature (Li et al. 2009) ) and offers protection against mortality risk at oldest-old ages. Our empirical findings imply that health outcome benefits of certain nutritional interventions, including tea drinking, may depend, in part, upon individual genetic profiles. Clearly, research on the effects of GxE (such as FOXO gene-by-tea drinking) interaction is useful for precision rejuvenation/life style intervention (akin to the concept of precision medicine) in the clinic or associated healthy aging intervention programs.

Because the FOXO1A genotype data were available for 2,481 oldest-old aged 91+ only, we restricted the present study to advanced ages only, and we were not able to explore effects of the FOXO1A-209-by-tea-drinking GxE interactions in the young-old. While we know that Chinese people in general mostly drink green tea and prior research demonstrated that consumption of green tea (not black tea or coffee) has been associated with reduced risk of cognitive function at old ages 60 and over <sup>[34]</sup>, we did not have data on what types of green tea or other tea the participants drink. Furthermore, we were not able to quantify the intake of active ingredients such as EGCG and other tea catechins. As the sub-sample size of the male oldest-old was not large enough, we included sex as a covariate in the hazard models to control for the potential

confounding effects of gender, but we were not able to conduct more detailed analysis for the

male and female oldest-old separately. These limitations will need to be addressed in the future

when new genotypic/phenotypic datasets for all elderly age groups with much larger sample sizes

for both genders become available.

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	<u>% or mean</u>						
Variables	Combined	Cohort	Cohort				
	Combined	1998	2008-2009				
Main explanatory variables							
Carrying FOXO1A-209 minor allele							
status							
0 сору	58.4%	58.9%	58.2%				
1 сору	35.4%	34.6%	35.7%				
2 copies	6.3%	6.5%	6.1%				
Drink tea at present time							
Almost everyday	21.6%	19.6%	20.3%				
Sometimes	13.5%	17.1%	15.6%				
Rarely or never	64.9%	63.3%	64.1%				
Covariates							
Males	25.0%	22.7%	26.1%				
Average age	100.0	100.9	99.6				
Urban residents	34.5%	28.3%	37.5%				
1+ year of schooling	18.1%	16.5%	18.9%				
Regular exercise	23.3%	23.6%	23.1%				
Smoking in recent 5 years	11.1%	11.7%	10.8%				
Currently drink alcohol	<u>17.3</u> %	<u>23.0</u> %	<u>14.6</u> %				
Number of participants	2481	810	1671				

Table 1. Descriptive statistics for the main explanatory variables and covariates

Cohort	Cohort 1998			Cohort 2008-2009				Two cohorts Combined				
Model	A-I	A-II	A-III	A-IV	B-I	B-II	B-III	B-IV	C-I	C-II	C-III	C-IV
FOXO1A-209, recessive=1(0) <sup>c</sup>	1.159	1.137			1.315*	1.288			1.253*	1.229*		
FOXO1A-209,additive			1.008	1.022			1.067	1.048			1.045	1.041
Drink tea, Yes (no)	1.060		1.064		0.972		1.091		1.004		1.073	
Drink tea, ordered variable		1.006		1.023		0.977		1.032		0.988		1.029
GxE interactions												
(FOXO1A-209,recessive) x	0.456** <sup>a</sup>				0.452**				0.466***			
(Drink tea, binary variable)	(0.037) <sup>b</sup>				(0.028)				(0.003)			
95% Confidence Interval	0.22,0.95				0.22,0.92				0.28, 0.77			
(FOXO1A-209, recessive) x		0.662**				0.653**				0.665***		
(Drink tea, ordered variable)		(0.048)				(0.042)				(0.005)		
95% Confidence Interval		0.44,1.00				0.43,0.98				0.50, 0.89		
(FOXO1A-209,additive) x			0.898				0.711***				0.794**	
(Drink tea, binary variable)			(0.424)				(0.018)				(0.012)	
95% Confidence Interval			0.69,1.17				0.55,0.91				0.66,0.95	
(FOXO1A-209,additive) x				0.918				0.841**				0.876**
(Drink tea, ordered variable)				(0.265)				(0.018)				(0.013)
95% Confidence Interval				0.79,1.07				0.73,0.97				0.79, 0.97
<u>Covariates</u>												
Male (female)	1.141	1.136	1.128	1.128	1.337***	1.340***	1.347***	1.346***	1.252***	1.253***	1.256***	1.255***
Age	1.078***	1.078***	1.076***	1.076***	1.101***	1.101***	1.100***	1.100***	1.093***	1.093***	1.093***	1.093***
Urban (Rural)	1.151	1.146	1.122	1.124	0.824**	0.827**	0.826**	0.830**	0.941	0.943	0.937	0.939
1+ year of schooling (0)	0.967	0.966	0.970	0.974	1.073	1.071	1.072	1.071	1.014	1.012	1.014	1.014
Regular exercise (no)	0.771***	0.777***	0.781**	0.784**	0.798**	0.798**	0.789***	0.790***	0.786***	0.787***	0.782***	0.784***
Smoke in recent 5 years (no)	1.089	1.099	1.079	1.080	0.957	0.956	0.951	0.954	0.994	0.996	0.980	0.982
Currently drink alcohol (no)	1.011	1.017	1.011	1.018	1.044	1.044	1.041	1.040	1.025	1.029	1.022	1.026
Cohort 1998 (no)									1.296***	1.297***	1.296***	1.299***
-21 L (-2 log Likelihood) <sup>d</sup>	7304.4	7304.7	7308.9	7308.0	11355.9	11356.4	11353.7	11355.2	20397.7	20397.9	20400.5	20399.7
	(7309.1)	(7309.0)	(7309.5)	(7309.3)	(11361.4)	(11361.2)	(11361.1)	(11360.9)	(20407.5)	(20406.7)	(20406.8)	(20406.1)
LR chi2	4.7	4.3	0.6	1.3	5.5	4.8	7.4	5.7	9.8	8.8	6.4	6.3
Prob > chi2 (p)	0.030	0.038	0.423	0.262	0.019	0.028	0.007	0.017	0.002	0.003	0.012	0.012

# Table 2. Mortality risk (hazard ratios) at advanced ages based on the Cox proportional hazards model estimates

Notes: <sup>a</sup> \*: p<0.1, \*\*: p<0.05; \*\*\*: p<0.01; <sup>b</sup> In addition to the p categories in <sup>a</sup>, the figures in parentheses below estimate of GxE terms are their p-values; <sup>c</sup> The categories "no" and "0" in the parentheses after the variables in the first column are reference groups for binary variables; <sup>d</sup> The figures in parentheses below the estimate of "-2LL" are the estimates of "-2LL"

in the models without the interaction blocks. The last line "Prob > chi2 (P)" presents the p values of the Chi-square tests to examine whether the difference in likelihood ratios between the full model including the interaction block and the model without the interaction block are statistically significant, following the standard Aiken and West procedure.<sup>27</sup>

Table 3. The hazard ratios of mortality risk  $(HR_{GE})^a$  and their differences by combinations of tea drinking status (E) <sup>a</sup> and the status of carrying the minor allele of FOXO1A-209 following the *recessive* model (G), based on the data of the two CLHLS cohorts combined

G: genotypic status	Binary te	a drinking	variable <sup>a</sup> Ordered tea drinking variable <sup>C</sup>					
(Recessive model)			% diff. <sup>d</sup>				% diff.	% diff.
	E=0	E=1	E=1 vs. 0	E=0	E=1	E=2	E=1 vs. 0	E=2 vs. 0
Non-carriers of the genotype: G=0	1.00(rof)	1.004	10 40/	1.00(rof)	1.076	0.958	+7.6%	-4.2%
	1.00(iei.)	(0.945) <sup>e</sup>	+0.4%	1.00(iei.)	(0.349)	(0.534)		
Carriers of the genotype: G=1	1.253	0.586	52 20/	1.253	0.644	0.564	19 60/	55.0%
	(0.073)	(0.017)	-55.5%	(0.073)	(0.285)	(0.029)	-40.0%	-55.0%
% difference G=1 vs.0	+25.3%	-41.6%		+25.3%	-40.1%	-41.1%		
Hazards ratio of	0.466			0.665				
GxE interaction term <sup>f</sup>	P=0.003; Cl <sup>1</sup> : 0.28,0.77			P=0.005; CI: 0.50, 0.89				

Notes: <sup>a</sup> *HR<sub>GE</sub>*: see online supplement materials on how *HR<sub>GE</sub>* are estimated. <sup>b</sup> Tea-drinking, binary variable: E= 0, rarely or never; E=1, almost every day or sometimes. <sup>c</sup> Tea-drinking, ordered variable: E= 0, rarely or never; E=1, sometimes, E=2, almost every day. <sup>d</sup> diff.: difference. <sup>e</sup> The figures in parentheses underneath the estimates of hazards ratios are p-values. <sup>f</sup> Hazards ratio of the GxE interaction term) are taken from the proportional hazards model estimates presented in Table 2. <sup>i</sup> CI: 95% confidence interval.

Table 4. The hazard ratios of mortality risk (HR <sub>GE</sub> ) and their differences by combinations of tea drinking status (E) and the
status of carrying the minor allele of FOXO1A-209 following the additive model (G), based on the data of the two cohorts
combined

G: genotypic status	Binary tea drinking variable			Ordered tea drinking variable				
(Additive model)			% diff.				% diff.	% diff.
	E=0	E=1	E=1 vs. 0	E=0	E=1	E=2	E=1 vs. 0	E=2 vs. 0
0 copy minor allele: G=0	1.00(ref.)	1.038 (0.601)	+3.8%	1.00(ref.)	1.087 (0.397)	1.005 (0.959)	+8.7%	+0.5%
1 copy minor allele: G=1	0.974 (0.706)	0.930 (0.393)	-4.6%	0.974 (0.703)	1.032 (0.800)	0.872 (0.191)	+5.9%	-10.5%
2 copies of minor allele: G=2	1.242 (0.091)	0.581 (0.015)	-53.2%	1.242 (0.091)	0.639 (0.276)	0.558 (0.028)	-48.6%	-55.1%
% difference G=1 vs.0	-2.6%	-10.5%		-2.6%	-5.1%	-13.2%		
% difference G=2 vs.0	+24.2%	-44.1%		+24.2%	-41.2%	-44.4%		
Hazards ratio of	0.794			0.876				
GxE interaction term	P=0.012; CI: 0.66,0.95			P=0.013; CI : 0.79, 0.97				

Notes: the same as in Table 3.

Figure 1. Survival curves by tea drinking status (E, binary) and the status of carrying minor allele of *FOXO1A-209* (G) following the *recessive* model based on Cox proportional hazard model, controlling for the respondents' age and other covariates at the baseline



Notes: 1) covariates include gender, age, rural or urban residence, education, marital status, regular exercise, smoking, and alcohol drinking. We also adjusted for the groups of 1998 cohort and 2008-2009 cohort in the combine analysis. 2) the survival curves were calculated at the mean values of all of the covariates.

Figure 2. Survival curves by tea drinking status (E, binary) and the status of carrying minor allele of *FOXO1A-209* (G) following the *additive* model, based on Cox proportional hazard model, controlling for the respondents' age and other covariates at the baseline



Notes: the same as in Figure 1.

An interaction between an environmental factor and a genotype is present if the association between the environmental factor and a health outcome indicator differs among individuals with different status of carrying the genotype. To understand the GxE interaction effects, regressions may be estimated separately for genotype carriers and non-carriers (dominant or recessive models), or separately for those who carry 0, 1, or 2 copies of the minor alleles (additive model), to assess the differences in effects of an environmental factor on a health outcome indicator among those who have different genotypes. If the genotype-specific regression analyses are to be carried out, however, sufficiently large sub-sample size is required for each genotype group, but such required data are likely not available in most circumstances, including our present study. Thus, we apply a simple procedure to assess the differences in effects of an environmental factor on a health outcome indicator among those who have different genotypes, without further dividing the samples. Note that this procedure was applied in previous publications in which the genotype was defined by following the dominant or recessive model and the environmental factors were binary variables in the logistic regression models. We extend here the procedure to the cases in which genotypes are defined by the additive model (or recessive or dominant model) and the environmental factors are ordered (or binary) variables, employing the Cox proportional hazards model.

In general, the Cox proportional hazards model is expressed as:

$$\log h_{i}(t) = \log h_{0}(t) + [\beta_{1}G_{i} + \beta_{2}E_{i} + \beta_{3}G_{i} * E_{i} + \sum_{i} \alpha_{j}X_{j_{i}}]$$
[1]

where  $h_i(t)$  is the hazard at time t of the i<sup>th</sup> individual and  $h_0(t)$  is the baseline hazard at time t; G<sub>i</sub> represents the genotype and E<sub>i</sub> represents environmental factor status of the i<sup>th</sup> individual; G<sub>i</sub>xE<sub>i</sub> is the interaction term of the genotype and environmental factors; X<sub>ji</sub> is a vector of covariate values corresponding to the i<sup>th</sup> individual. Coefficients  $\beta_1$ ,  $\beta_2$ ,  $\beta_3$ and  $\alpha_j$  measure the hazards of mortality risk for the corresponding variables. G<sub>i</sub> may be a binary variable (dominant or recessive model) or an ordered variable (additive model); E<sub>i</sub> may be a binary variable (E<sub>i</sub> = 1 or 0 refers to exposure or not exposure to the environmental factor, such as drinking tea or not-drinking tea), or an ordered variable (E<sub>i</sub>=0, 1, 2,...; such as E<sub>i</sub>=0, 1, 2 refers to never, sometimes and often drinking tea).

Let  $HR_{GE}$  represent the hazard ratio of mortality risk of those with a combination of the genotype status of carrying the minor allele(s) (G) such as the FOXO1A-209 genotype and an environmental factor (E) such as tea drinking. Note that there are two limitations if one simply uses general Cox proportional hazards model expressed in Equation (1) and the coefficients  $\beta_1$ ,  $\beta_2$  and  $\beta_3$  produced by the standard software to estimate the hazard ratios of mortality risk ( $HR_{GE}$ ) for those individuals with combined statuses of the genotype and the environmental factor. First, we have no way to estimate the p values of  $HR_{GE}$  based on the coefficients  $\beta_1$ ,  $\beta_2$ ,  $\beta_3$  and the other is proof

outcomes produced by the standard software. The second limitation is that it would involve an unrealistic assumption. For example, using Equation (1) to estimate  $HR_{GE}$  in the present study would implicitly assume that the mortality risk for those who carry 2 copies (G<sub>i</sub>=2) of the FOXO1A-209 minor allele is twice as high as that for those who carry one copy (G<sub>i</sub>=1) of the minor allele, and assume that mortality risk for those who often drink tea (E<sub>i</sub>=2) is twice as high as that for those who sometimes drink tea (E<sub>i</sub>=1); these assumptions may likely not be correct in real world. To avoid these two limitations, we estimate HR<sub>GE</sub> and their p values by setting up several exclusive dummy variables Z<sub>GE</sub> in the regression equations. Z<sub>GE</sub> represents the combinations of the genotype status (the subscript G = 0, 1 for dominant and recessive models, or G = 0, 1, 2 for additive model) and the environmental factor status (the subscript E = 0 or 1 for binary variable).

We estimated the hazard ratios of mortality risk (HR<sub>GE</sub>) of the following four types of combinations of FOXO1A-209 genotypes (with recessive or additive model) and environmental factor of tea drinking (binary or ordered variable), using the Equations below, and the results are presented in Tables 3 and 4, Figures 1 and 2: (1) FOXO1A-209 genotypes with recessive model and tea drinking binary variable:  $\log h_i(t) = \log h_0(t) + [\gamma_{01}Z_{G_i=0,E_i=1} + \gamma_{10}Z_{G_i=1,E_i=0} + \gamma_{11}Z_{G_i=1,E_i=1} + \sum_i \alpha_i X_{ji}]$  [2]

(2) FOXO1A-209 genotypes with recessive model and tea drinking ordered variable:

$$\log h_i(t) = \log h_0(t) + \left[\sum_{E_i=1}^2 \gamma_{0E_i} Z_{G_i=0,E_i} + \sum_{E_i=0}^2 \gamma_{1E_i} Z_{G_i=1,E_i} + \sum_j \alpha_j X_{ji}\right]$$
[3]

(3) FOXO1A-209 genotypes with additive model and tea drinking binary variable:

$$\log h_i(t) = \log h_0(t) + [\gamma_{0E_1} Z_{G_i=0,E_1} + \sum_{G_i=1}^2 \sum_{E_i=0}^1 \gamma_{G_iE_i} Z_{G_iE_i} + \sum_j \alpha_j X_{ji}]$$
[4]

(4) FOXO1A-209 genotypes with additive model and tea drinking ordered variable:

$$\log h_i(t) = \log h_0(t) + \left[\sum_{E_i=1}^{2} \gamma_{0E_i} Z_{G_i=0,E_i} + \sum_{G_i=1}^{2} \sum_{E_i=0}^{2} \gamma_{G_iE_i} Z_{G_iE_i} + \sum_{j} \alpha_j X_{ji}\right]$$
[5]

As shown by the results presented in Tables 3 and 4 and Figures 1 and 2, the estimates of  $HR_{GE}$  based on the regressions models expressed in Equations [2]-[5] with dummy variables  $Z_{GE}$  which represent the combinations of the statuses of genotype and the environmental factor adequately and intuitively reveal the GxE effects, although there are no explicit interaction terms in the regression equations.